

Chromosomal Position Effects Are Linked to Sir2-Mediated Variation in Transcriptional Burst Size

Cory Batenchuk,^{†‡} Simon St-Pierre,^{†‡} Lioudmila Tepliakova,^{†‡} Samyuktha Adiga,^{†§} Anna Szuto,^{†§} Nazir Kabbani,^{†§} John C. Bell,^{§||} Kristin Baetz,^{§||} and Mads Kærn^{†¶*}

[†]Ottawa Institute of Systems Biology, [‡]Department of Cellular and Molecular Medicine, [§]Department of Biochemistry, Immunology and Microbiology, and [¶]Department of Physics, University of Ottawa, Ottawa, Ontario, Canada; and ^{||}Ottawa Hospital Research Institute, Ottawa, Ontario, Canada

ABSTRACT Gene expression noise varies with genomic position and is a driving force in the evolution of chromosome organization. Nevertheless, position effects remain poorly characterized. Here, we present a systematic analysis of chromosomal position effects by characterizing single-cell gene expression from euchromatic positions spanning the length of a eukaryotic chromosome. We demonstrate that position affects gene expression by modulating the size of transcriptional bursts, rather than their frequency, and that the histone deacetylase Sir2 plays a role in this process across the chromosome.

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*Correspondence: mkaern@uottawa.ca

Cells display considerable variability in gene expression due to fluctuations in the rates of gene activation, transcription, and translation. In eukaryotes, slow promoter kinetics can result in transcriptional bursting and high cell-to-cell variability (noise) in gene expression (1). This phenomenon has been linked to gene position through spatial variation in the recruitment and retention of transcription factors, nucleosomes, and chromatin remodeling complexes (2–6). However, high-throughput studies of endogenous gene expression in yeast have failed to provide strong support for this hypothesis (7,8), presumably due to the masking of position effects by gene- and promoter-specific variables.

To characterize chromosome position effects independently of gene- and promoter-specific variables, we integrated reporter cassettes at 128 different euchromatic loci along the length of chromosome III in *Saccharomyces cerevisiae* (Fig. 1 *a*). We measured reporter expression driven by two promoters with contrasting architectures (9). The *ADHI* promoter (P_{ADHI}) is a covered promoter where gene expression is facilitated by SAGA (10) and a consensus TATA-box occupied by nucleosomes (11). Both features are linked to high transcriptional noise (7,12). The *ACT1* promoter (P_{ACT1}) has a contrasting open promoter architecture where nucleosome deposition is inhibited by the presence of a Poly(dA::dT) tract (9) and through Reb1-mediated DNA bending (13).

We quantified reporter gene expression by flow cytometry, and calculated the population-average expression and expression noise from measured fluorescence intensity distributions (see Supporting Material). For P_{ADHI} , the distribution was bimodal at two positions located between the heterochromatic regions at the left telomere and the silenced HML mating type locus (see Fig. S1 in the Supporting Material). A similar effect was recently observed when a fluorescent reporter gene was flanked by artificial Sir-mediated silencing gradients (14). For P_{ACT1} at the same positions (Fig. S1), and at all other posi-

tions, the intensity distributions were unimodal. In the following, we focus on the unimodal expression distributions.

We observed that the average reporter expression and expression noise vary considerably across the chromosome for both promoters (Fig. 1, *b* and *c*). As expected, P_{ADHI} is more sensitive to position effects than P_{ACT1} , and displays the highest variation in both expression level and expression noise. Nevertheless, expression noise is significantly correlated between the two promoters ($p = 4 \times 10^{-9}$, Table S1), suggesting that the observed position effects are linked to common, promoter-independent factors.

To identify these factors, we compared our data to polymerase II occupancy and histone modifications across chromosome III (Fig. 1 *d*, (15)). In this analysis, we mitigated potential effects of gene disruption by excluding experimental outliers and averaging over nearest-neighbor positions (see Supporting Material). We observed significant correlations between our data and regions depleted in polymerase II binding and acetylation of histone lysines H3K9, H3K14, and H4K16 (Table S1), targeted by the histone deacetylase Sir2 (16). Notably, expression noise is negatively correlated with polymerase binding ($p = 5 \times 10^{-8}$ for P_{ACT1} , $p = 3 \times 10^{-4}$ for P_{ADHI}) and H4K16 acetylation ($p = 4 \times 10^{-15}$ for P_{ACT1} , $p = 2 \times 10^{-15}$ for P_{ADHI}). Moreover, regions with low polymerase binding and high apparent Sir2 activity are robustly enriched in low expression and high noise positions (Fig. S2). As expected, these positions are predominantly located adjacent to heterochromatin.

To gain insight into the mechanistic origin of chromosomal position effects, we analyzed a stochastic model of

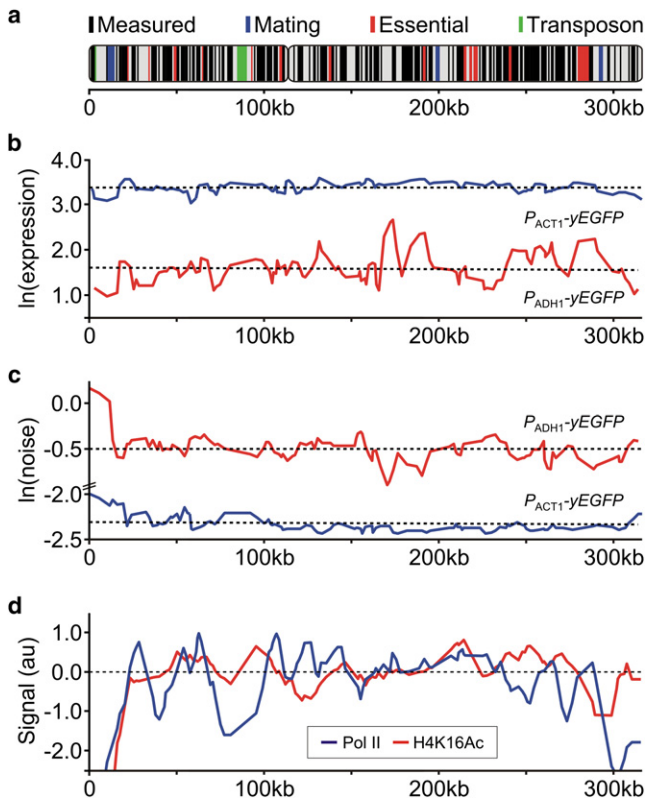


FIGURE 1 Mapping position effects. (a) Position measured and chromosome III landmarks. (b) Population-average expression. (c) Relative standard deviation (noise). (d) Variation in polymerase II occupancy and H4K16 acetylation across chromosome III (see Supporting Material).

gene expression involving transitions between active and inactive promoter states and fluctuations in mRNA and protein abundances (Fig. 2 a). In this model, which is discussed in detail in (1), transcriptional burst size is defined by the ratio of the mRNA synthesis rate (k_M) and the promoter deactivation rate (k_{off}). Correspondingly, two different scenarios, variation in k_M or in k_{off} , involve modulation of burst size. We also consider a scenario where position effects arise from variation in burst frequency, which is determined by the promoter activation rate (k_{on}), and a scenario where transcriptional bursting is absent. Since the four scenarios predict different dependencies of noise on average expression (see Supporting Material), we can use model discrimination techniques to determine which one best explains the experimental data.

The measured dependency of noise on average expression can be fitted well to variation in k_M across the chromosome ($r = 0.96$ for P_{ACT1} and $r = 0.91$ for P_{ADH1} , Fig. 2 b). For P_{ADH1} (Fig. 2 b, inset), the experimental data is also explained reasonably well by variation in burst size through modulation of k_{off} (Table S3). Indeed, variation in burst size (through k_M or k_{off}) explains the experimental data significantly better than variation in burst frequency ($p = 6 \times 10^{-5}$ for k_M versus k_{on} , and $p = 0.02$ for k_{off} versus k_{on}). In fact, the burst frequency

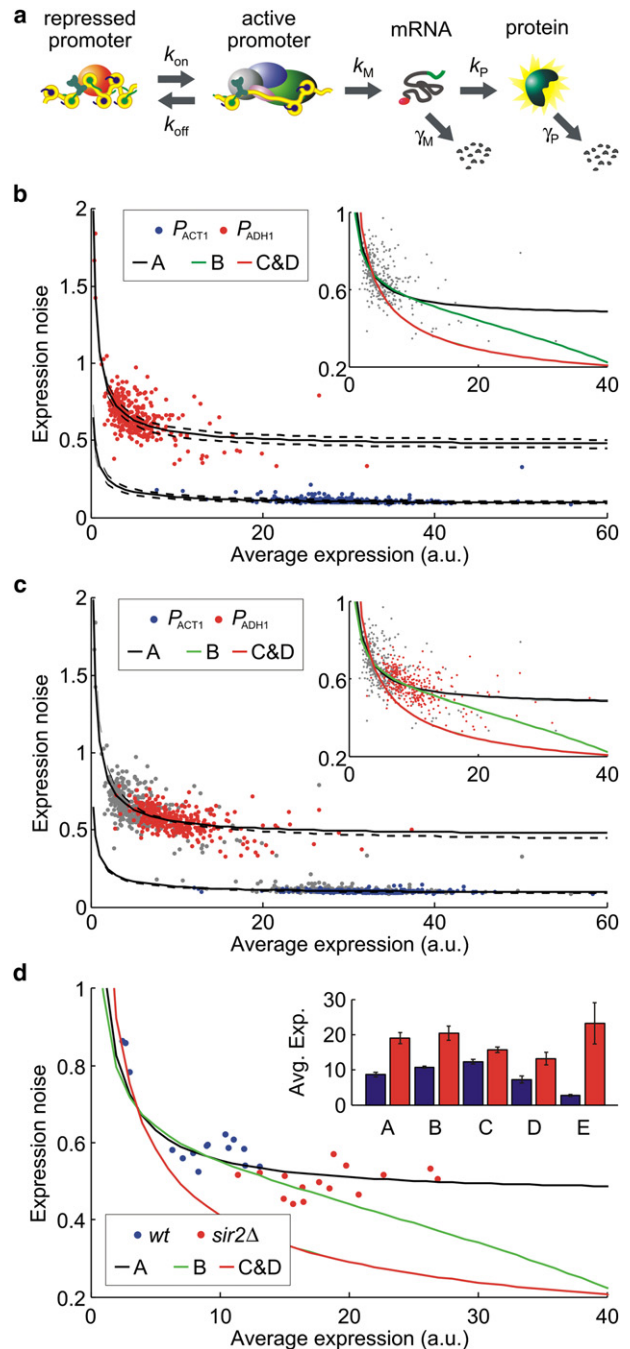


FIGURE 2 (a) Stochastic model defining position effects in terms of transcriptional bursting. Scenario A, B, and C corresponds to variation in k_M , k_{off} , and k_{on} , respectively. Scenario D assumes no transcriptional bursting. (b) Full curves are fit to scenario A. Broken curves indicate the 95% confidence interval. Inset displays all fits to P_{ADH1} data. (c) Full and broken curves show the fit of scenario A in the absence (gray) and presence (blue/red) of the nicotinamide, respectively. Inset displays all fits to P_{ADH1} data. (d) P_{ADH1} expression characterized for five loci in the presence (blue) and absence (red) of Sir2 (A: YCR020C; B: YCL030C; C: YCL037C; D: YCR060W; E: YCL064C). Inset shows the effect of Sir2 deletion on average expression.

scenario never performs better than that where transcriptional bursting is absent (Fig. 2 b, inset, Table S3). For P_{ACT1} , the four scenarios perform equally well, suggesting that its low expression noise is due to low transcriptional bursting.

To establish the involvement of Sir2, we quantified the impact of the Sir2 inhibitor, nicotinamide, on P_{ADH1} and P_{ACT1} expression across the chromosome (Fig. 2 c). As expected, nicotinamide had the greatest impact at positions associated with high Sir2 activity (Fig. S3). For P_{ADH1} expression, the dependency of noise on average expression, measured in the presence of nicotinamide, is captured well by modulation of transcriptional burst size across the chromosome (Figs. 2 c and Fig. S5). As before, variation in burst size (through k_M or k_{off}) is significantly better at explaining the experimental data comparative variation in burst frequency ($p = 3 \times 10^{-37}$ for k_M versus k_{on} , and $p = 4 \times 10^{-46}$ for k_{off} versus k_{on} , Fig. 2 c).

We confirmed a role of Sir2 by characterizing the effect of Sir2 deletion on P_{ADH1} expression at a position adjacent to the heterochromatic HML (YCL064C), and four other randomly chosen positions. The greatest effect was observed adjacent to the HML (Fig. 2 d). For all tested positions, the measured effect is captured by variation in burst size, but not by variation in burst frequency ($p = 3 \times 10^{-11}$ for k_M versus k_{on} , $p = 10^{-22}$ for k_{off} versus k_{on} , Fig. 2 d). Interestingly, in these experiments, modulation of mRNA synthesis rates captures the data better than variation in promoter deactivation rates ($p = 3 \times 10^{-2}$).

Our finding that chromosomal position modulates burst size rather than frequency is consistent with previous studies of gene expression noise in mammalian cells using randomly integrated viral promoters (4,6). It is also consistent with the finding that the chromatin structure established by Sir2 is permissive to promoter activation, and suppresses mRNA synthesis by blocking a step downstream of transcription initiation (17). Indeed, our *sir2* Δ mutant data supports a model where Sir2 modulates the rate of mRNA synthesis differentially across the chromosome. However, the mechanisms involved in Sir2-mediated transcriptional repression remain controversial. Notably, P_{ADH1} and P_{ACT1} are strong promoters, and it is possible that Sir2 has more profound effects on the burst frequency of weak promoters. Additionally, whereas we observe significant Sir2-linked effects at most positions across the chromosome, the activity of Sir2 is typically viewed as being restricted to heterochromatic regions. This view has been challenged by systematic analysis documenting widespread binding of Sir2 across euchromatic genes, including *ACT1* and *ADH1* and other highly transcribed genes (18). Given our observations, it appears that Sir2 may play a more global role than previously anticipated.

SUPPORTING MATERIAL

Supporting methods, six figures, and four tables are available at [http://www.biophysj.org/biophysj/supplemental/S0006-3495\(11\)00464-4](http://www.biophysj.org/biophysj/supplemental/S0006-3495(11)00464-4).

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